



# MUlti-SpEctral, MUlti-SpECies, MUlti-SEnsors (MUSES) Retrievals for “A Train”, Suomi-NPP, and TROPOMI

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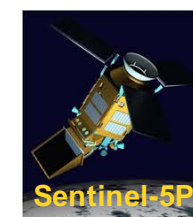
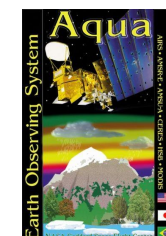
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<sup>07</sup> NOAA Center for Satellite Applications and Research, USA

<sup>08</sup> University of Maryland Baltimore County, USA

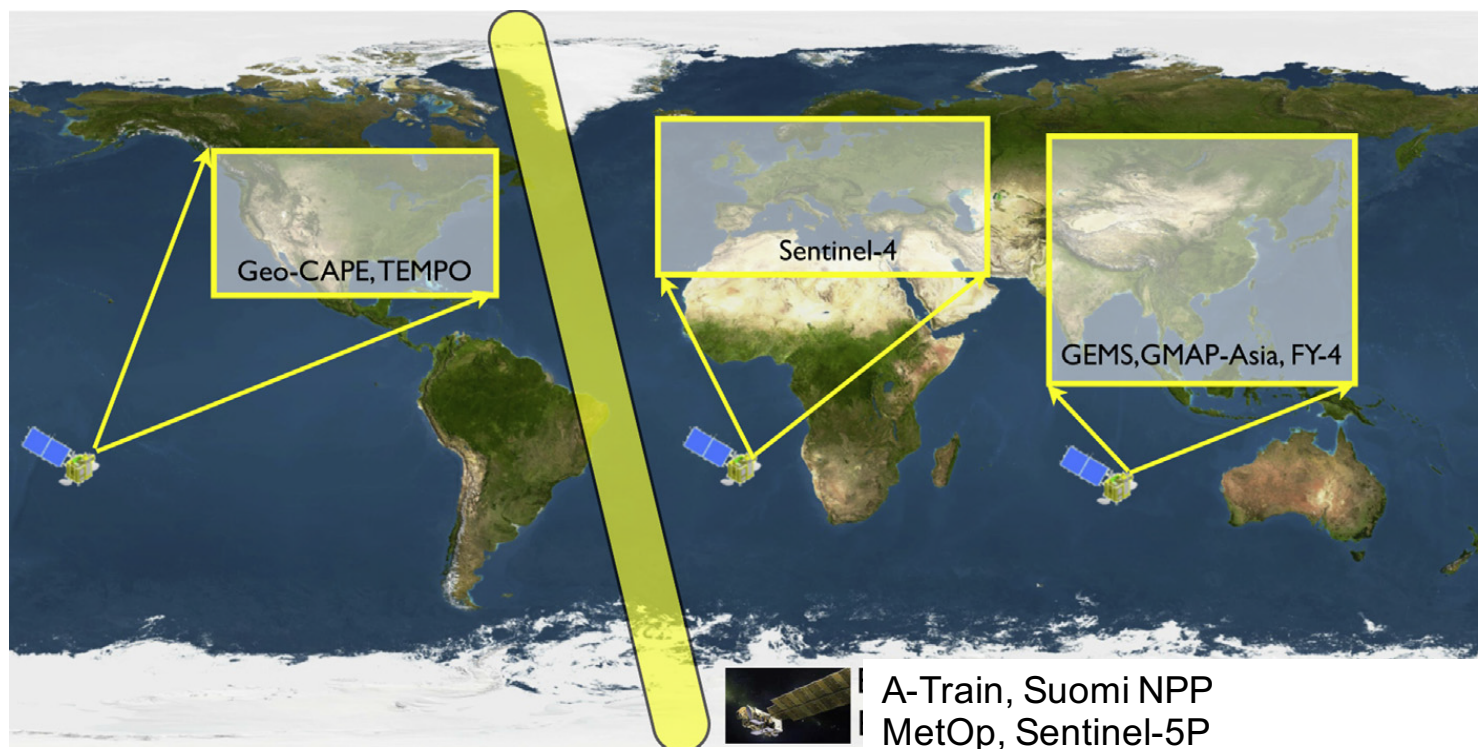




# A new Atmospheric Composition Constellation to Observe Global and Regional Pollution and Greenhouse Gases

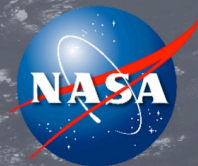
The rapid change in global emissions and their impact of air quality and climate requires a new observing system of GEO and LEO sounders to quantify global sources of local pollution and inferring surface carbon fluxes [Bowman, 2013; Fu *et al.*, 2016].

- LEO A-Train AIRS/OMI and SNPP CrIS/OMPS can support this constellation by distinguishing lower and upper tropospheric O<sub>3</sub> signals.
- LEO sounders will be a crucial link between GEO sounders over America, Europe and Asia as well as the sole satellite observations in the SH.
- LEO joint CrIS/TROPOMI measurements can provide the high resolution CO/CH<sub>4</sub> profile data [Fu *et al.*, 2016].

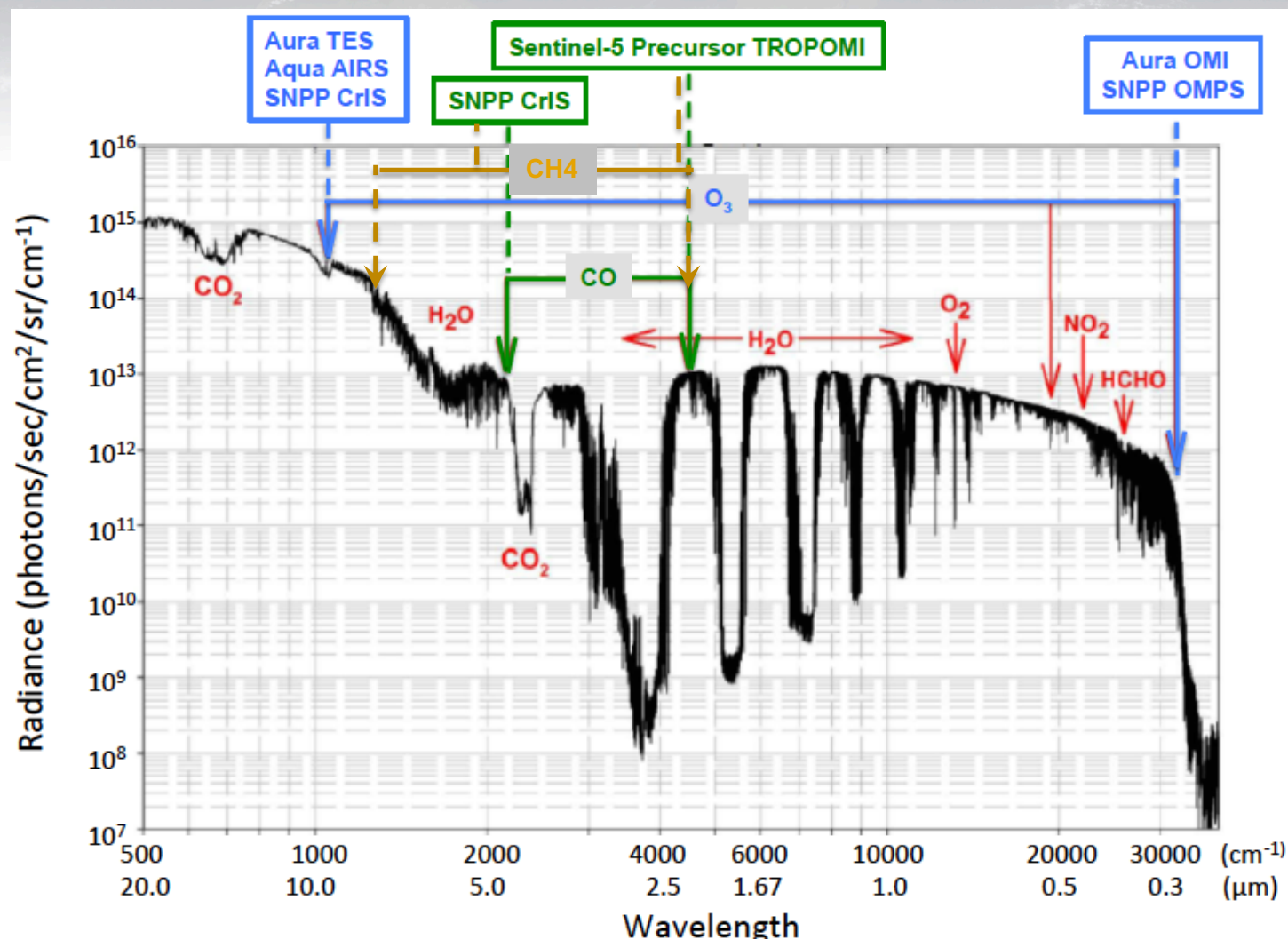


Adapted from  
Bowman, *Atm. Env.*, 2013





# Spectral Regions Used in Joint Retrievals



Measurements from TIR (LW) are sensitive to the free-tropospheric trace gases.  
Measurements from UV-Vis-NIR (SW) are sensitive to the column abundances of trace gases.  
Joint LW/SW measurements can distinguish upper troposphere from lower troposphere.



# JPL MUSES Retrieval Algorithm

## Multi-Spectra, Multi-Species, Multi-Sensors (MUSES)

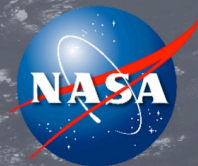
- Builds off of heritage from the Aura Tropospheric Emission Spectrometer (TES) optimal estimation (OE) algorithm to combine *a priori* and satellite data [Worden et al., 2007; Fu et al., 2013; Fu et al., 2015]

$$\mathbf{x}_{i+1} = \mathbf{x}_i + \left[ \mathbf{S}_a^{-1} + \underbrace{\mathbf{K}_{SW}^T \mathbf{S}_{\varepsilon_{SW}}^{-1} \mathbf{K}_{SW}}_{SW} + \underbrace{\mathbf{K}_{LW}^T \mathbf{S}_{\varepsilon_{LW}}^{-1} \mathbf{K}_{LW}}_{LW} \right]^{-1} \\ * \left[ \mathbf{S}_a^{-1} (\mathbf{x}_a - \mathbf{x}_i) + \underbrace{\mathbf{K}_{SW}^T \mathbf{S}_{\varepsilon_{SW}}^{-1} (\mathbf{L}_{SW} - \mathbf{F}_{SW}(\mathbf{x}))}_{SW} + \underbrace{\mathbf{K}_{LW}^T \mathbf{S}_{\varepsilon_{LW}}^{-1} (\mathbf{L}_{LW} - \mathbf{F}_{LW}(\mathbf{x}))}_{LW} \right]$$

## Key characteristics

- ✧ Use common a priori  $\mathbf{x}_a$  and  $\mathbf{S}_a$
- ✧ Instrument specific precision  $\mathbf{S}_{\varepsilon_{LW}}$ ,  $\mathbf{S}_{\varepsilon_{SW}}$
- ✧ Forward model ( $\mathbf{F}$ ) and Jacobians ( $\mathbf{K}$ ) for LW and SW sensors
  - ✧ Clouds, surface property
  - ✧ Instrument response function



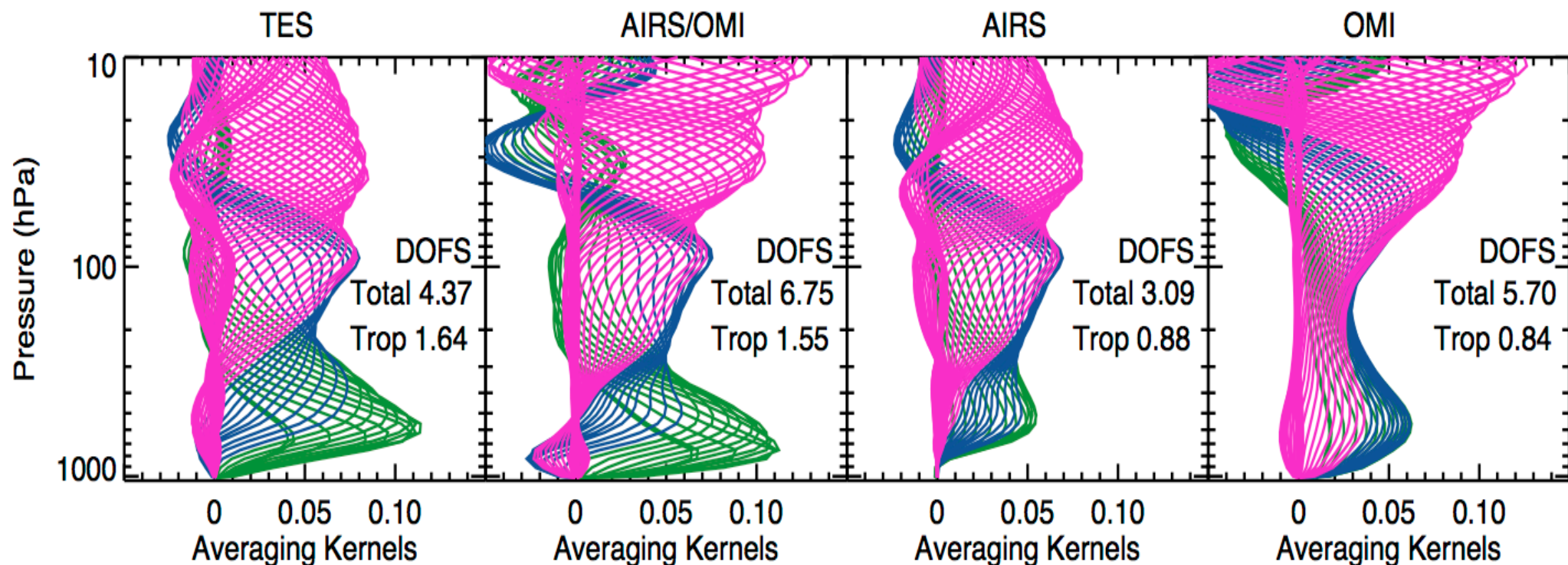


# Sample Averaging Kernels and Estimated Uncertainty

- ✧ MUSES provides observation operator (H) needed for data assimilation

$$H(x) = x_a + \mathbf{A}(x_{\text{model}} - x_a)$$

- ✧ Averaging kernel matrix (A) is the sensitivity of the retrieved state to the true state.
- ✧ The trace of averaging kernel matrix is the degree of freedom for signals (DOFS).



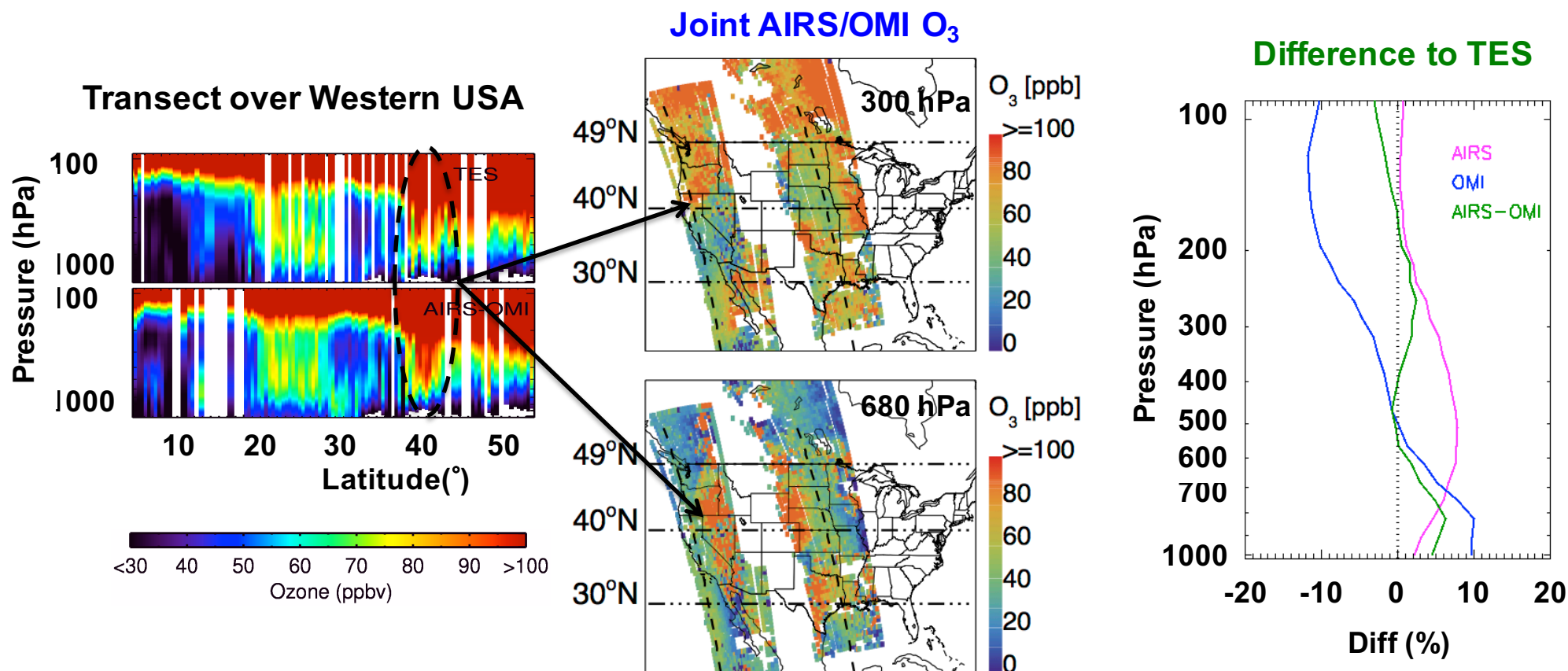


# Joint AIRS/OMI and TES observations on August 23, 2006 during TexAQS Aircraft Flight Campaign

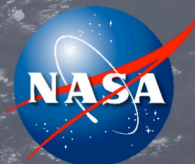
TES O<sub>3</sub>, AIRS/OMI O<sub>3</sub>, AIRS CO and cloud retrievals on August 23, 2006 during TexAQS aircraft flight campaign have been processed using common MUSES algorithm.

## Joint AIRS/OMI ozone retrievals

- Differ from the *a priori* profiles
- Show best agreement to TES, in comparisons to each instrument alone

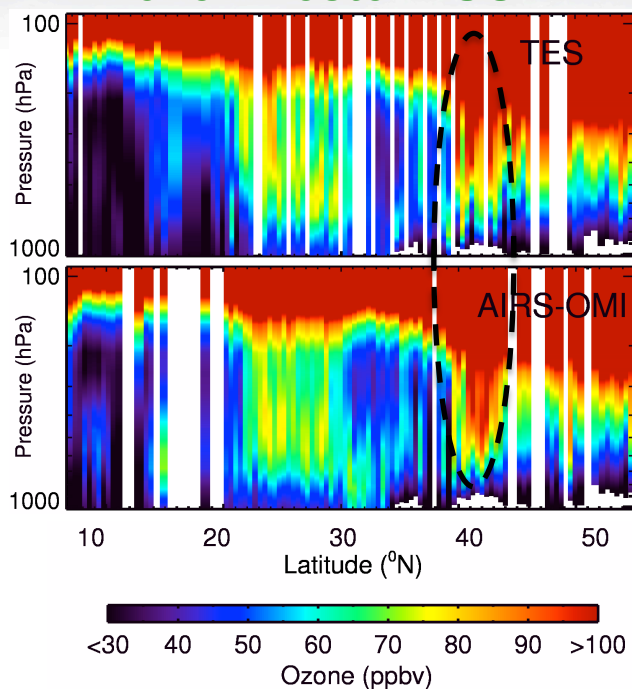




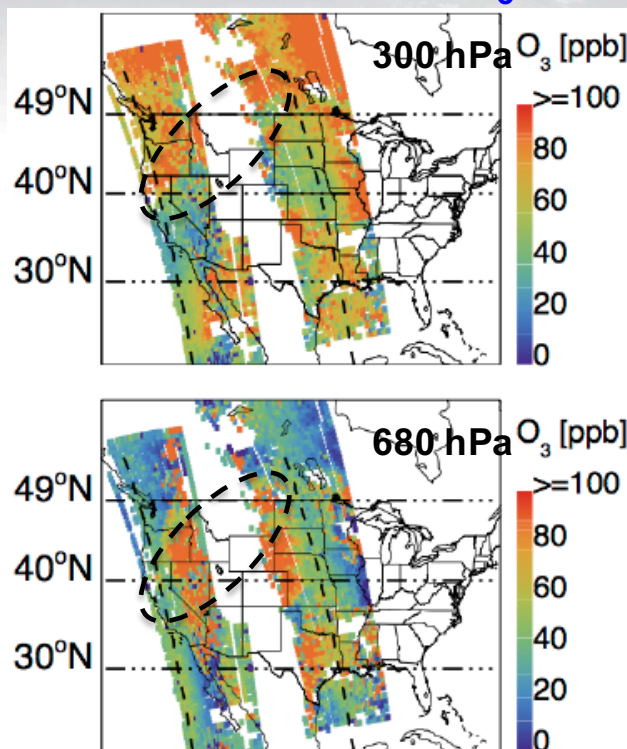


# Impact of Biomass Burning on Ozone Distribution on August 23, 2006 during TexAQS Aircraft Flight Campaign

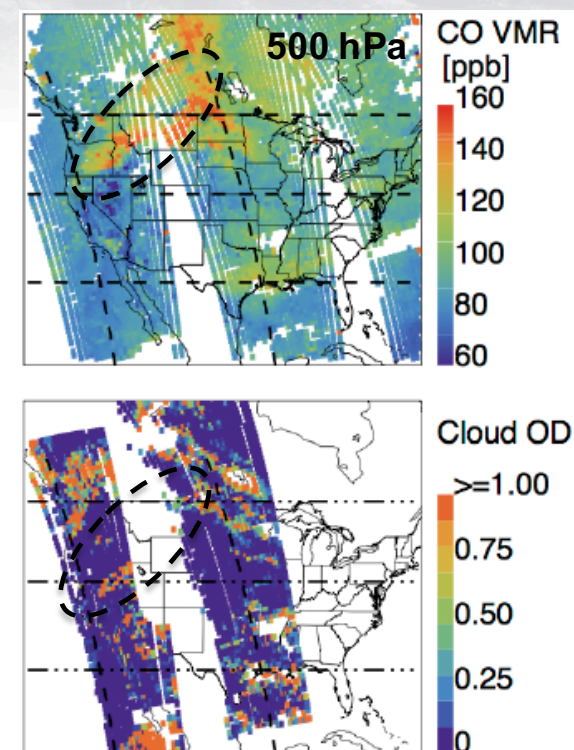
## Collocated TES & Joint AIRS/OMI O<sub>3</sub> Measurements over Western USA



## Joint AIRS/OMI O<sub>3</sub>



## AIRS CO and Cloud

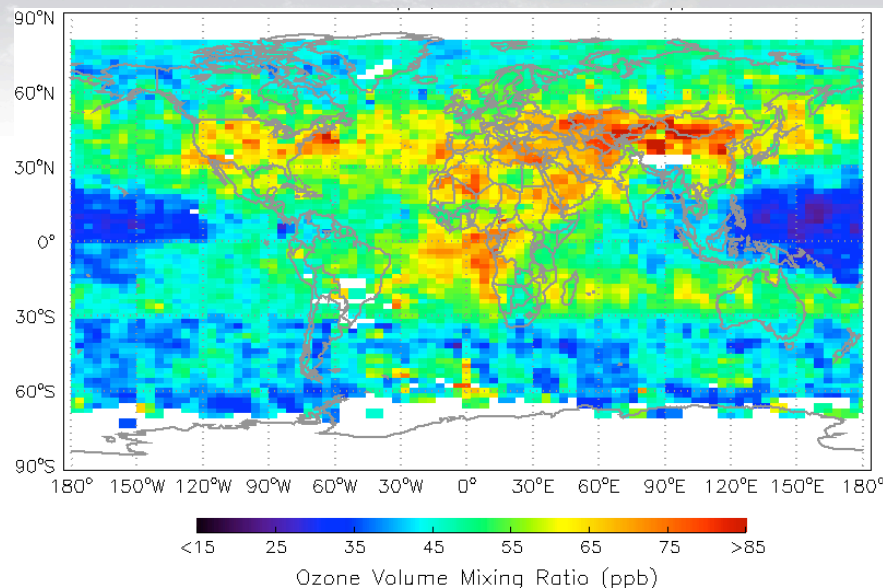


- The enhanced ozone at 680 hPa is collocating to the enhanced CO due to the fire emissions.
- Joint AIRS/OMI retrievals distinguish the amount of O<sub>3</sub> between lower and upper trop, similar to TES, with broader spatial coverage, which helps in distinguishing between stratospheric influences and biomass burning.
- MUSES has been extended to additional species (NH<sub>3</sub>, CH<sub>3</sub>OH, HCOOH, CH<sub>4</sub>, PAN) using measurements from multiple space sensors (TES, AIRS, CrIS, OMI, OMPS, TROPOMI).



# Monthly Mean Ozone Global Maps

## Joint AIRS/OMI



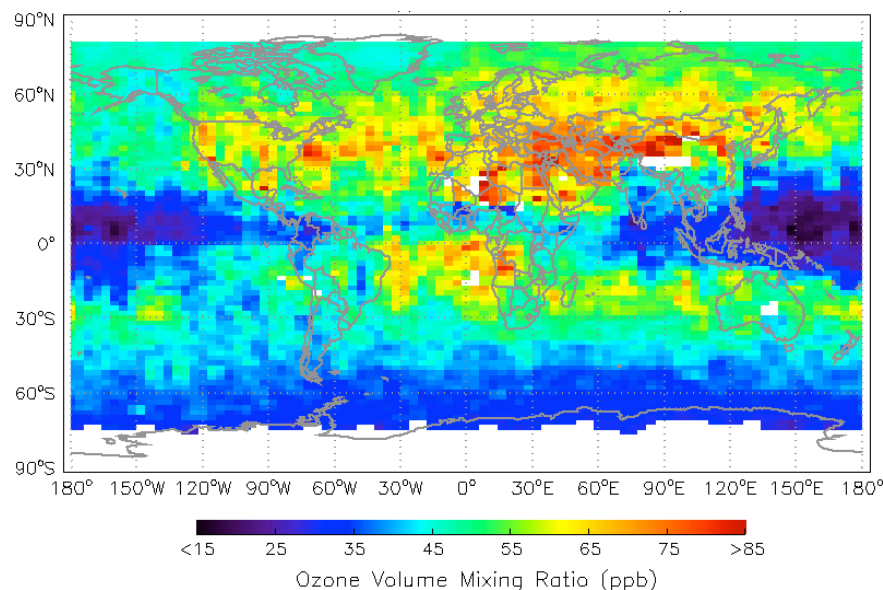
The JPL (MS)<sup>3</sup> has been implemented and applied to joint AIRS/OMI ozone retrievals over global scale

➤ August 2006

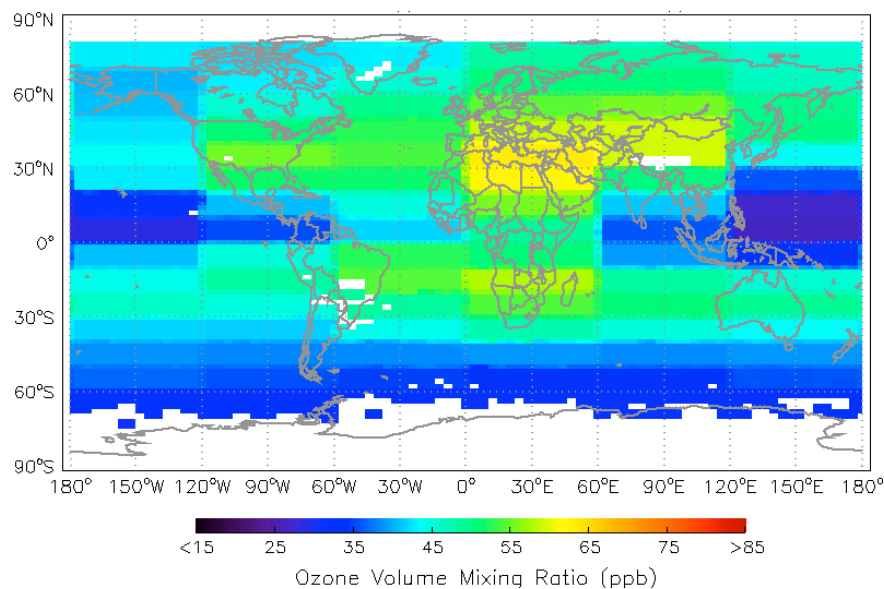
## Characteristics

- Differ from *a priori*
- Both TES and Joint AIRS/OMI show similar spatial patterns, e.g., capturing the enhanced ozone over the continental outflow and biomass burning active regions

## TES



## *a priori*

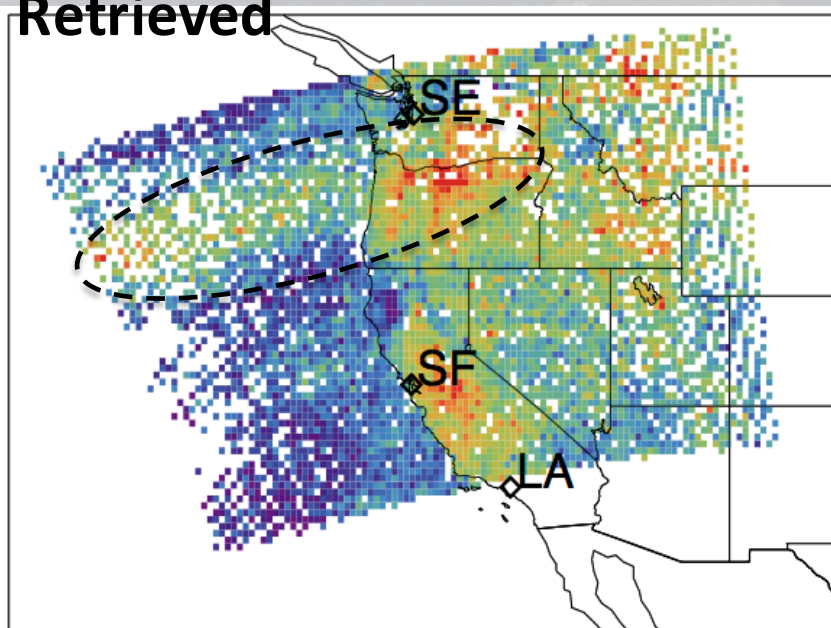




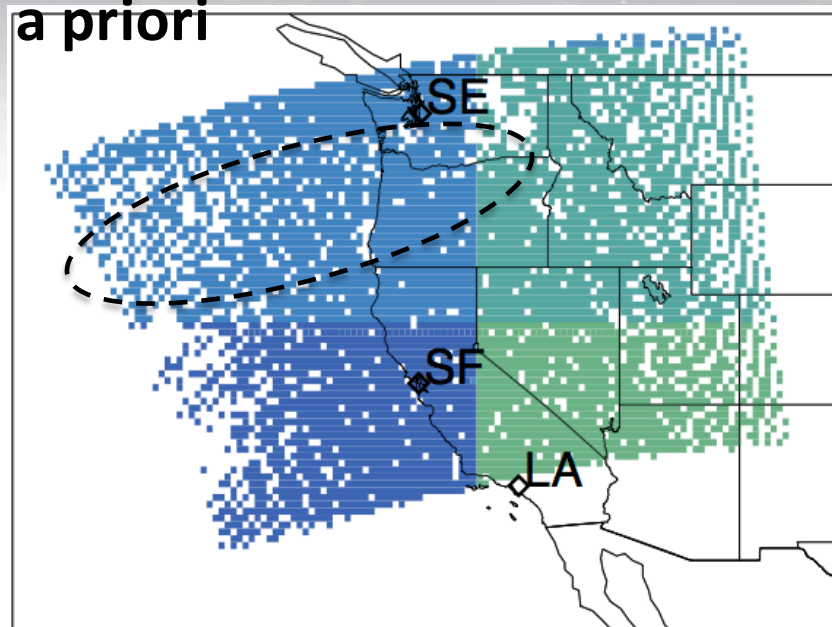


# Retrievals Using MUSES Algorithm and SNPP Measurements in Support of the coming NOAA FIREX Intensive Campaign

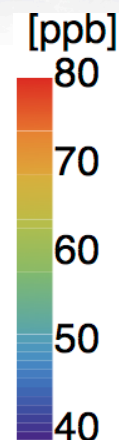
**Retrieved**



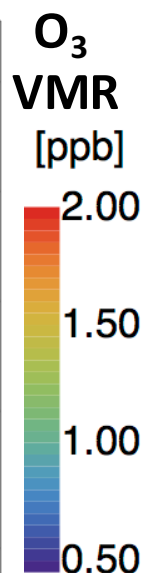
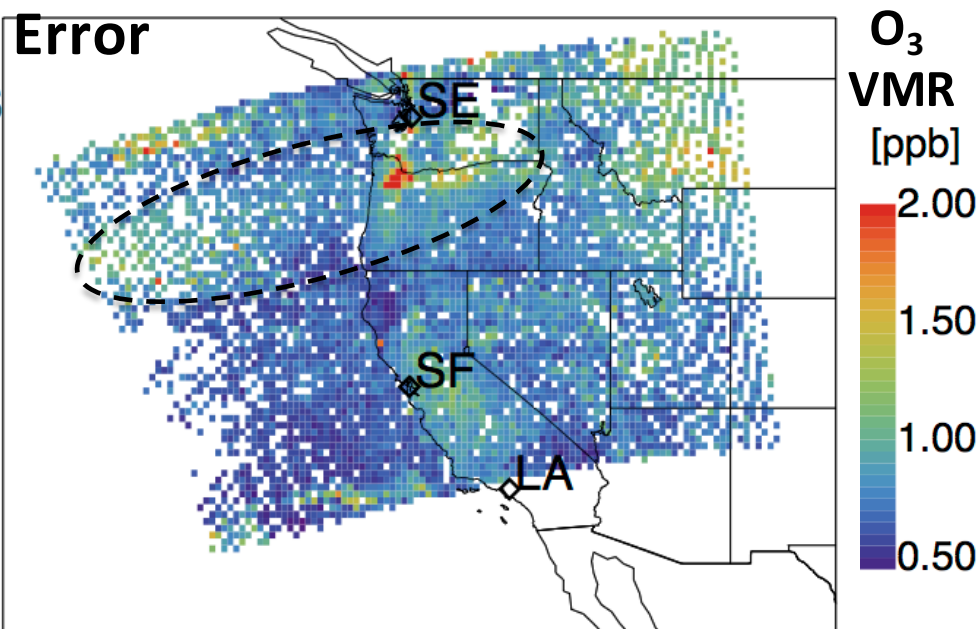
**a priori**



O<sub>3</sub> VMR

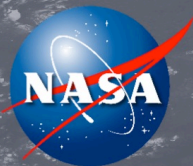


**Error**



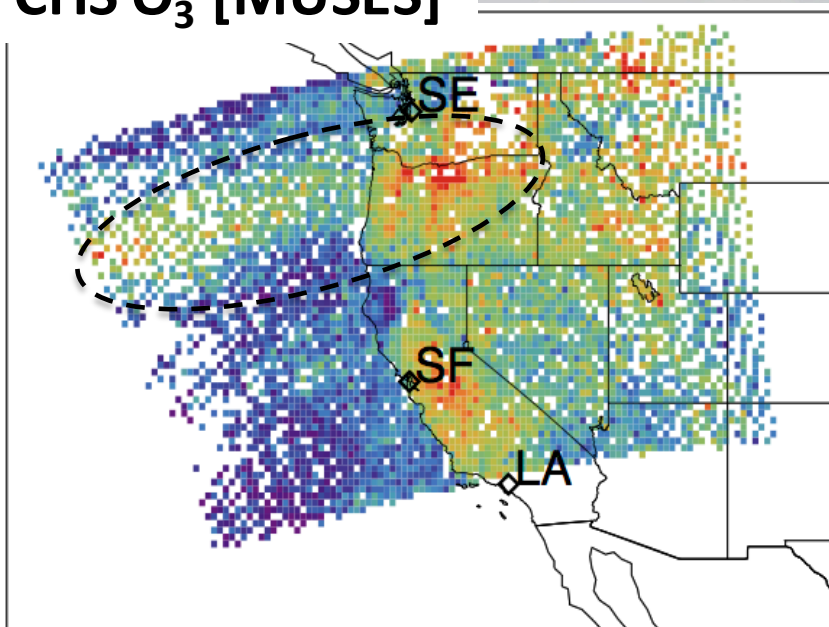
## CrIS O<sub>3</sub> retrievals using MUSES

- August 19, 2015
- Single footprint (14 x 14 km<sup>2</sup> at Nadir)
- Full spectral resolution (0.625 cm<sup>-1</sup>)
- Provides observation operator (H) needed for data assimilation
- Cloud OD ≤ 1.0

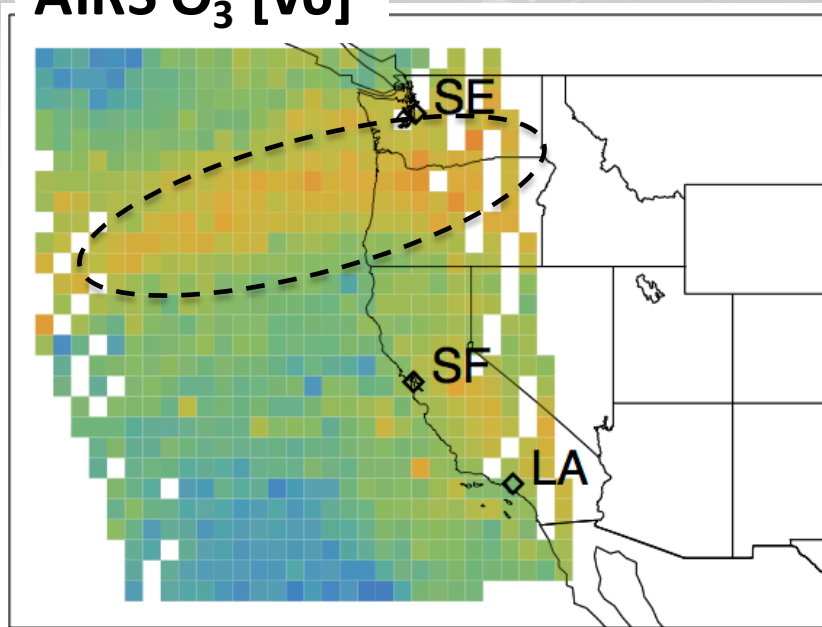


# Observations from AIRS, CrIS and MODIS on Aug 19, 2015

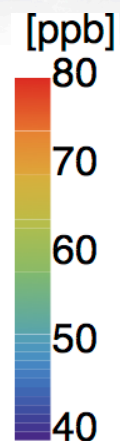
## CrIS O<sub>3</sub> [MUSES]



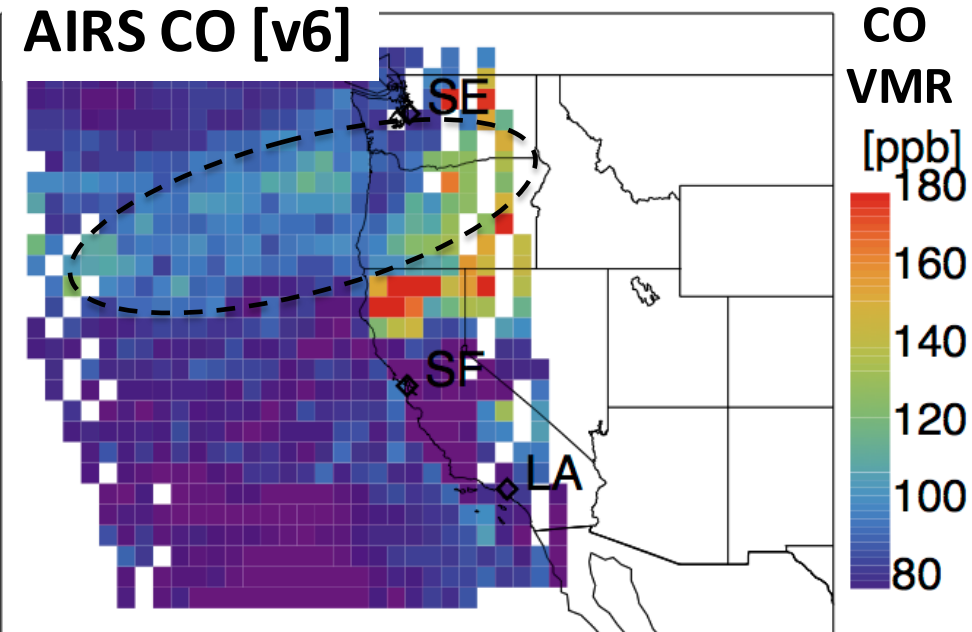
## AIRS O<sub>3</sub> [v6]



O<sub>3</sub> VMR

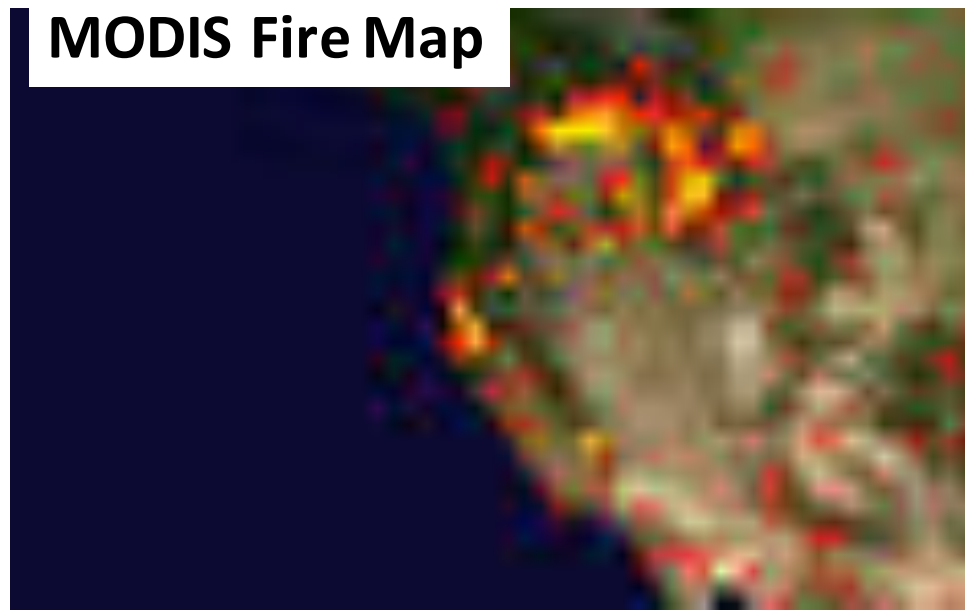


## AIRS CO [v6]



CO VMR  
[ppb]  
180  
160  
140  
120  
100  
80

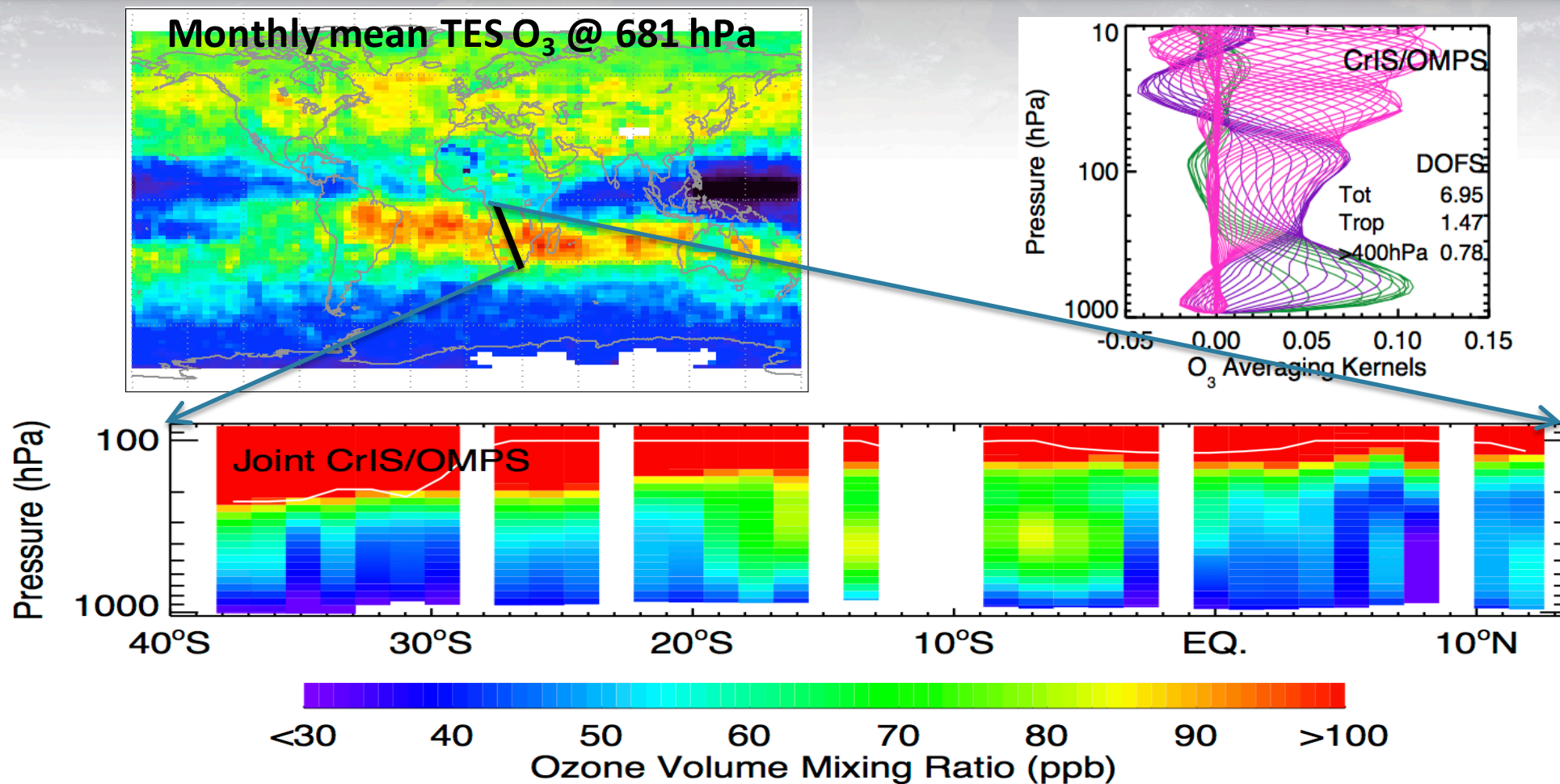
## MODIS Fire Map



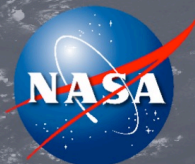




# Extension to Joint CrIS/OMPS O<sub>3</sub> Retrievals



- MUSES has been applied to joint CrIS/OMPS ozone retrievals over Africa on October 21, 2013.
- The elevated ozone concentrations between 2 - 20° S are associated with biomass burning.
- Joint CrIS/OMPS O<sub>3</sub> and CrIS CO retrievals using MUSES will support the NOAA FIREX flight campaign (Fire Influence on Regional and global Environments Experiment) – an intensive study of the impacts of western North America fires on climate and air quality.



# CrIS and MOPITT CO during Biomass Burning on August 27-28, 2013

**Motivation:** MOPITT's unique thermal IR/near IR multispectral CO measurements, which are able to separate near-surface from the free troposphere, have no planned follow-on.

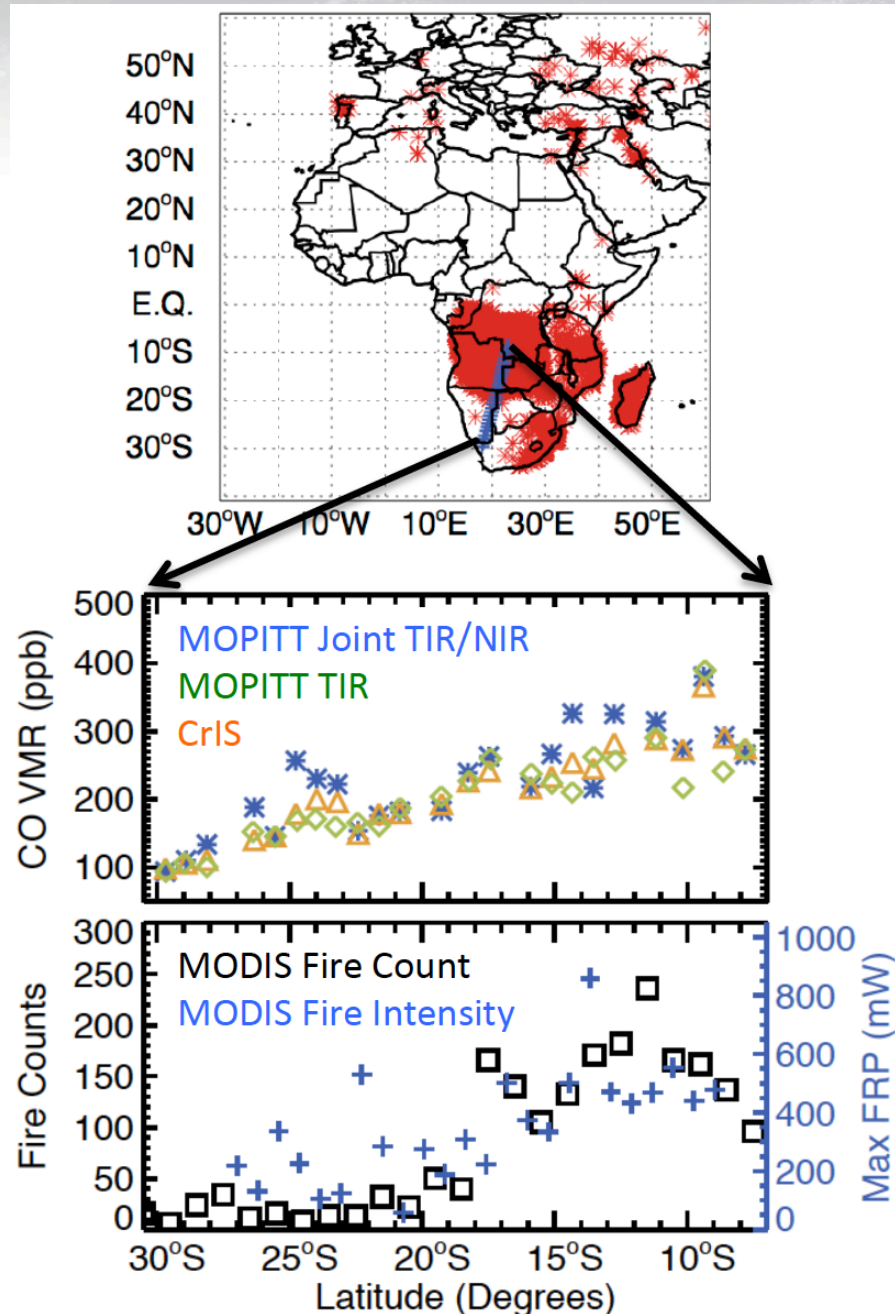
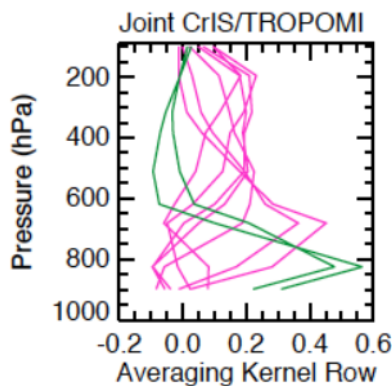
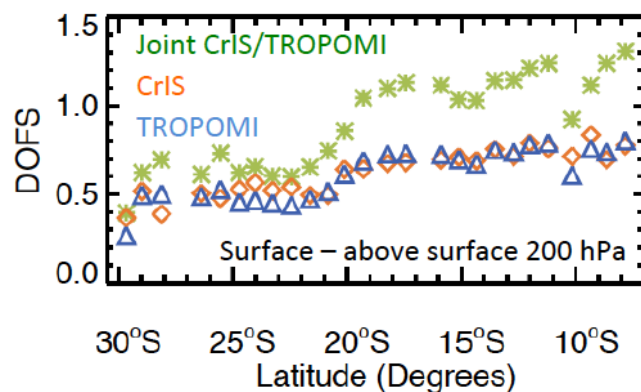
We applied the MUSES algorithm to the retrieval of CO VMR profiles from the NOAA/NASA CrIS Measurements. An analysis showed that combining CrIS TIR with the Sentinel 5p TROPOMI NIR data would have comparable to vertical sensitivity of MOPITT but with daily coverage (Fu *et al.*, 2016).

## MOPITT and CrIS

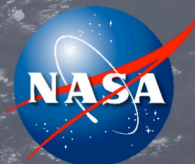
- Real CrIS single footprint, full spectral resolution measurements
- MUSES algorithm was used in

## Joint CrIS/TROPOMI

- Synthetic retrievals with realistic conditions
- MUSES algorithm



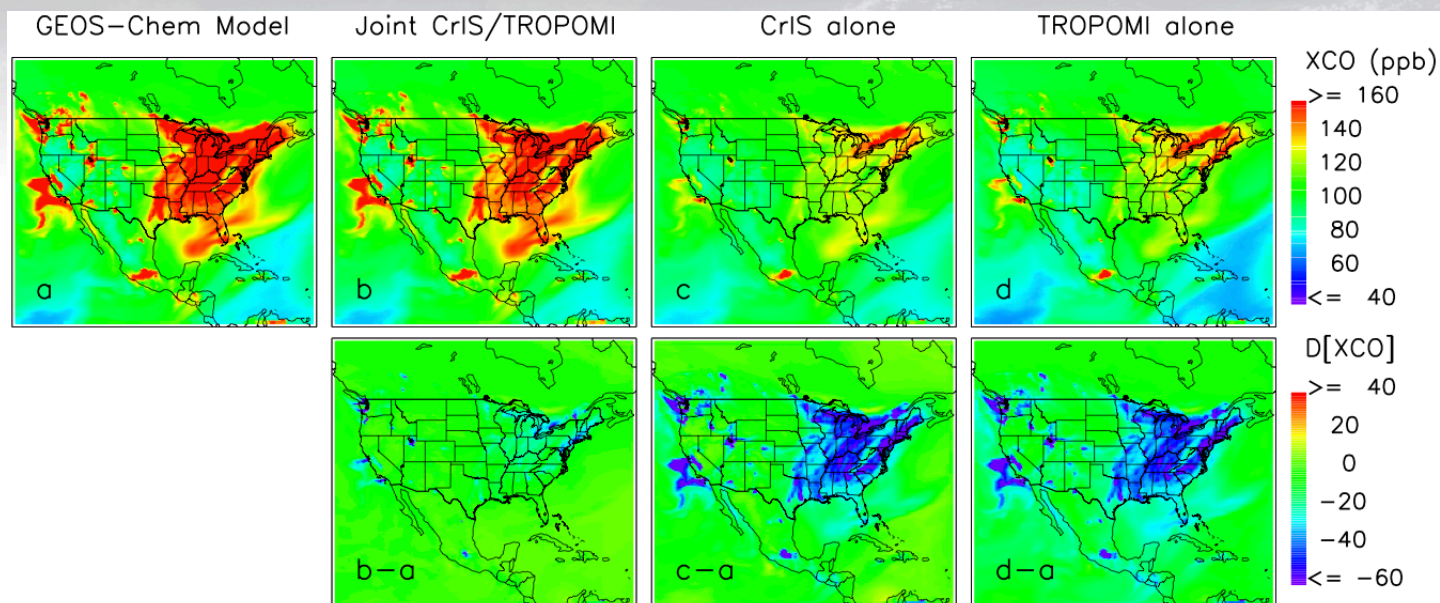




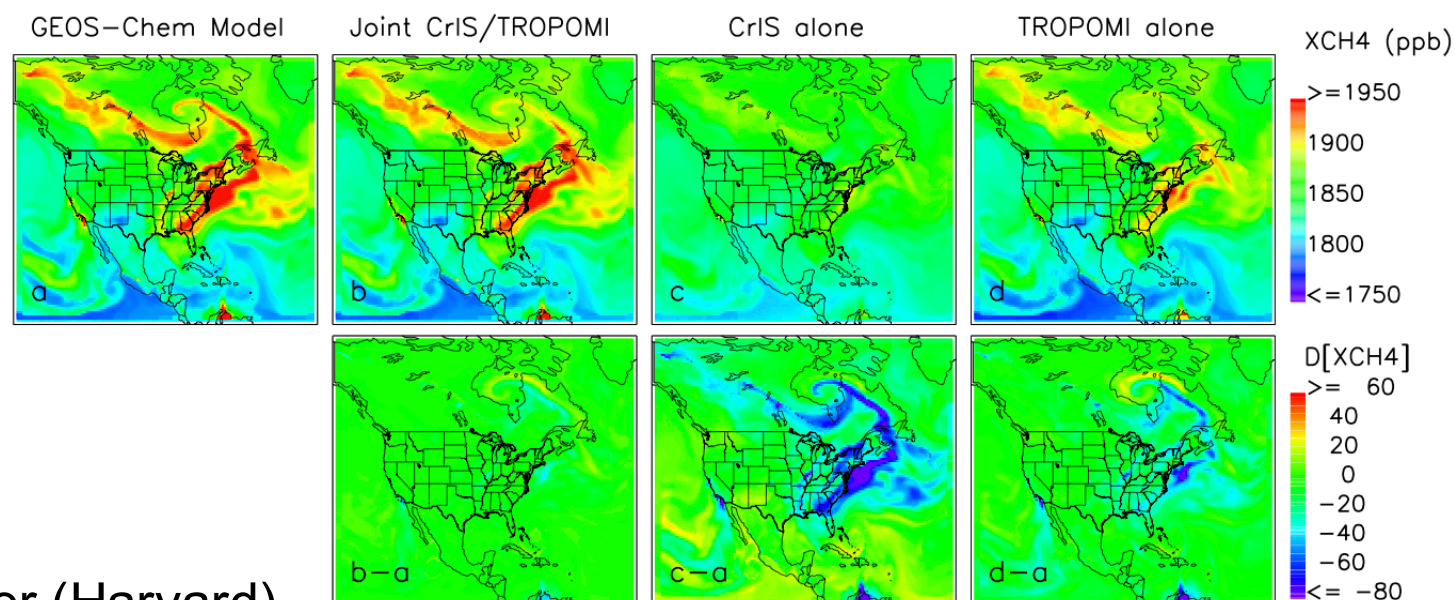
# High Resolution CO/CH<sub>4</sub> Profile Data Through Combining TROPOMI/CrIS Measurements

Joint CrIS/TROPOMI retrievals could lead to

- Extend and improve the MOPITT joint TIR/NIR **CO** data



- Extend and Improve the joint TES/GOSAT **CH<sub>4</sub>** data



GC run courtesy A. Turner (Harvard)



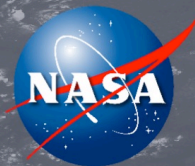
# Summary

- The scientific objectives and societal impacts of Aura are as relevant as ever
  - No obvious follow-on to Aura
  - Community focus has been on geostationary observations, e.g., GEO-CAPE, TEMPO, GEMS
  - Critical need to assess the potential of “committed” LEO sounders to continue Aura (and other EOS) observations
  - Decadal survey missions should be considered in light of that potential.
- MUSES retrieval algorithm can combine radiances measured from LW and SW sensors including TES, AIRS, CrIS, OMI, OMPS, TROPOMI.
  - ❖ Joint AIRS/OMI and CrIS/OMPS retrieved ozone profiles meet TES ozone vertical accuracy but surpass spatial coverage.
  - ❖ Joint CrIS/TROPOMI retrieved carbon monoxide profiles show similar vertical resolution as MOPITT TIR/NIR, but with a factor of two finer footprint size and daily global coverage.
- The optimal estimation approach of MUSES provides observation operators and characterization of joint data products needed for data assimilation.
- These observations have the potential to be the pillar of an international air quality constellation [Bowman, 2013].





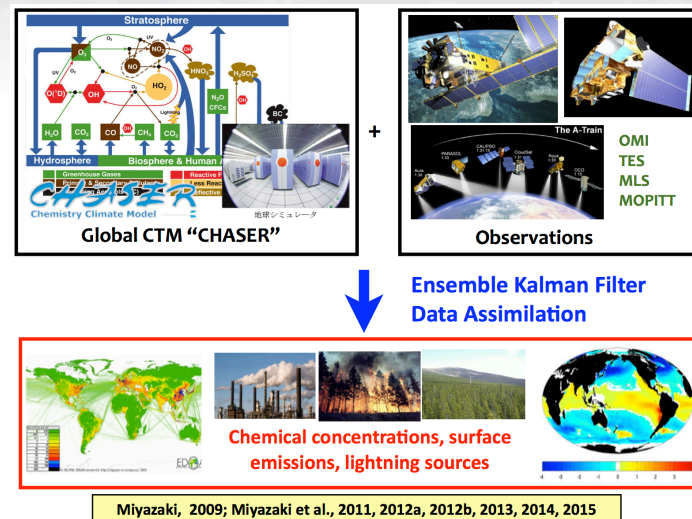
# Backup



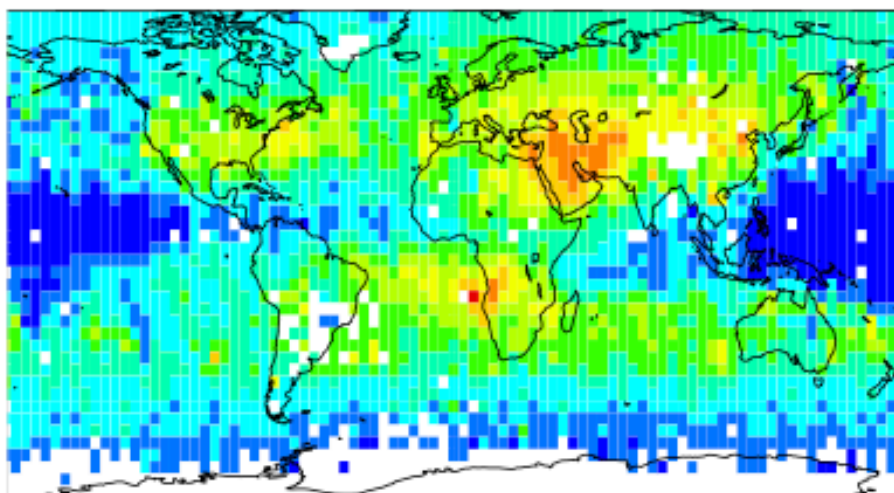
# Data Assimilation System of the NASA A-Train Observations

- MUSES algorithm delivered joint AIRS/OMI ozone and observation operator that enable data assimilation, e.g., the CHASER-DA.
- Assimilations of AIRS/OMI ozone leads to enhanced concentration over middle east and south Africa.
- Consistent to the previous study of the summertime buildup of tropospheric ozone abundances over the Middle East [Liu et al. 2009]

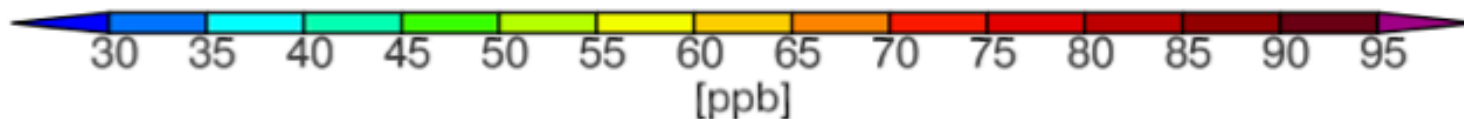
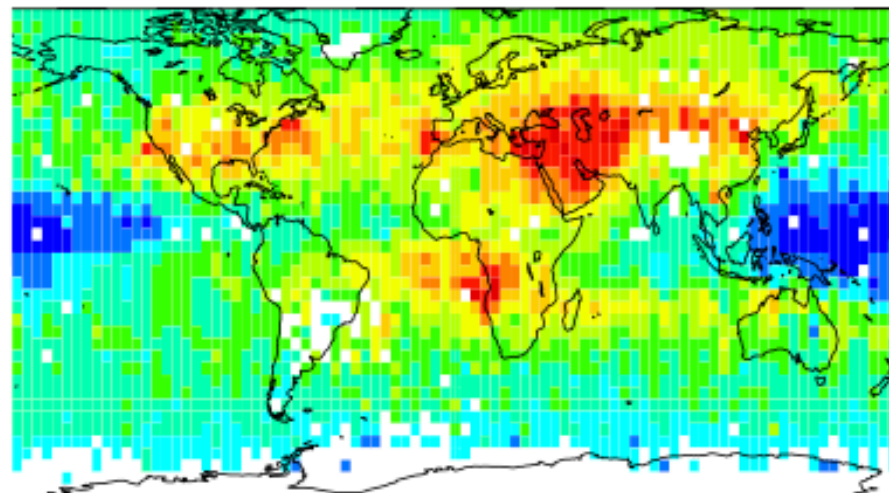
➤ Dr. Kazuyuki Miyazaki, implemented the CHASER data assimilation system.



**CHASER CTM Prediction**



**Data Assimilation Combined AIRS/OMI and CHASER**





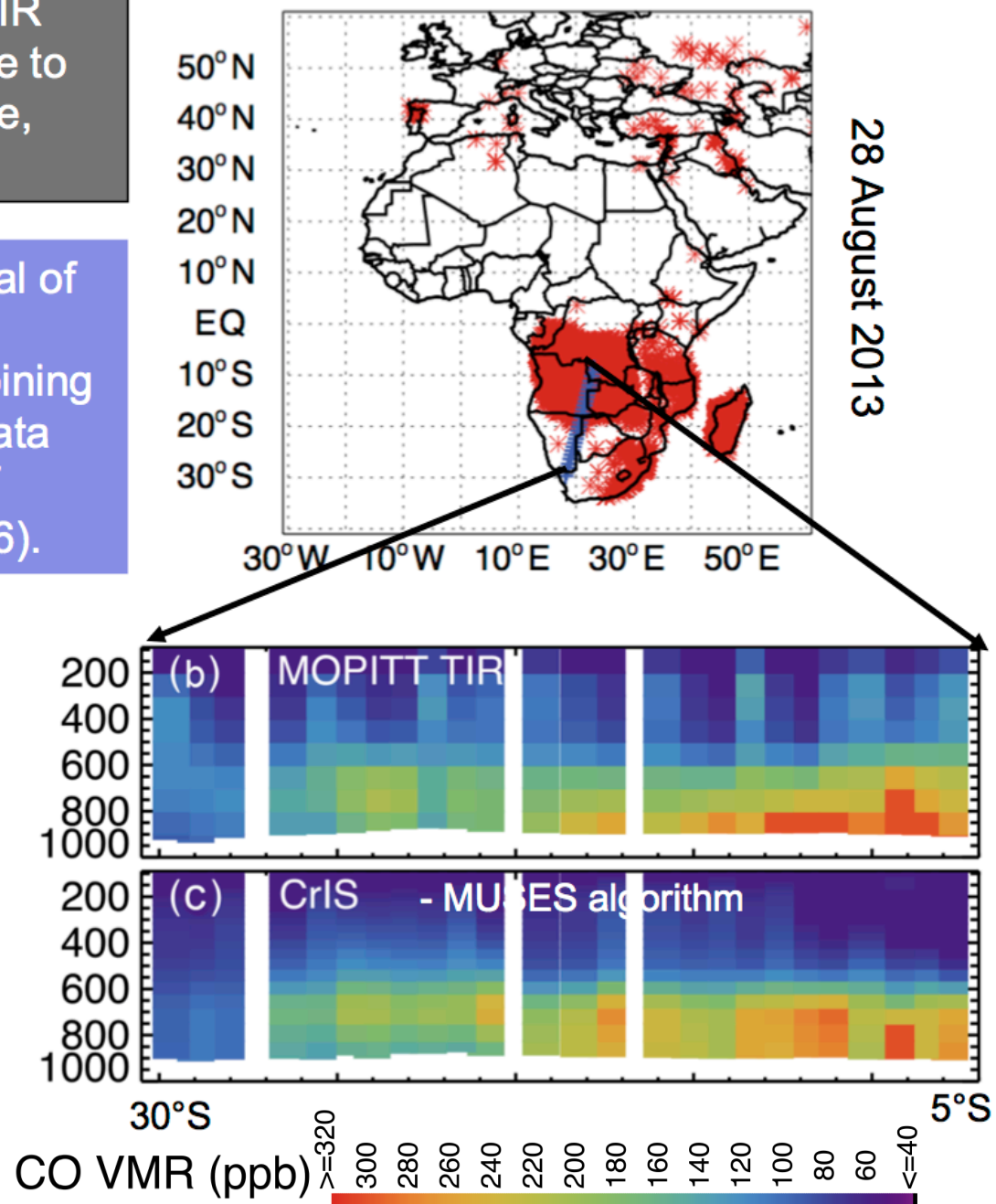
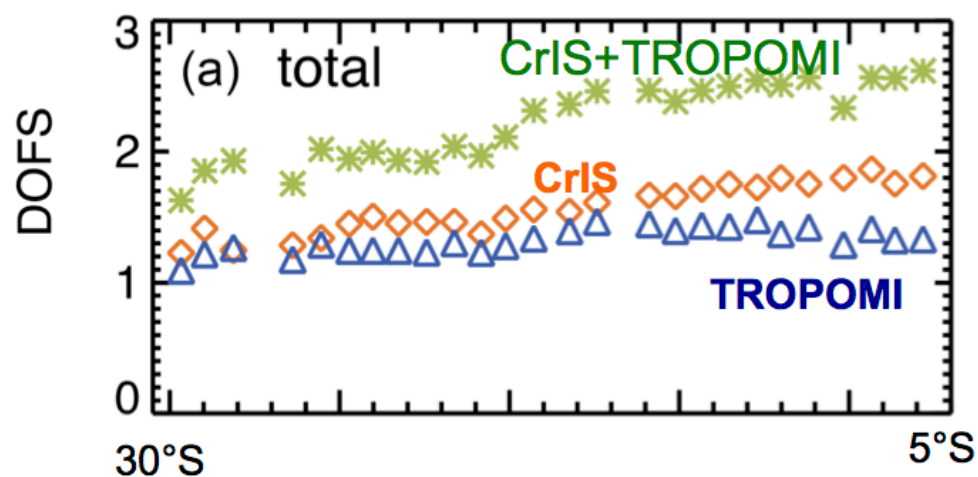


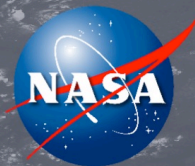
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## Synthetic retrievals, realistic conditions





# Monthly O<sub>3</sub> Global Maps

## – towards Providing Decade Long Global Ozone Profiles

The JPL MUSES has been implemented and applied to joint AIRS/OMI ozone retrievals over global scale. We are processing June to August 2006 data.

Characteristics (e.g., August 2006)

- Both TES and Joint AIRS/OMI show similar spatial patterns, e.g., capturing the enhanced ozone over the continental outflow and biomass burning active regions
- Differ from *a priori*

